



ERGO Bioinformatics Suite: tools for microbial genome analysis

BKD Meeting, November 2005

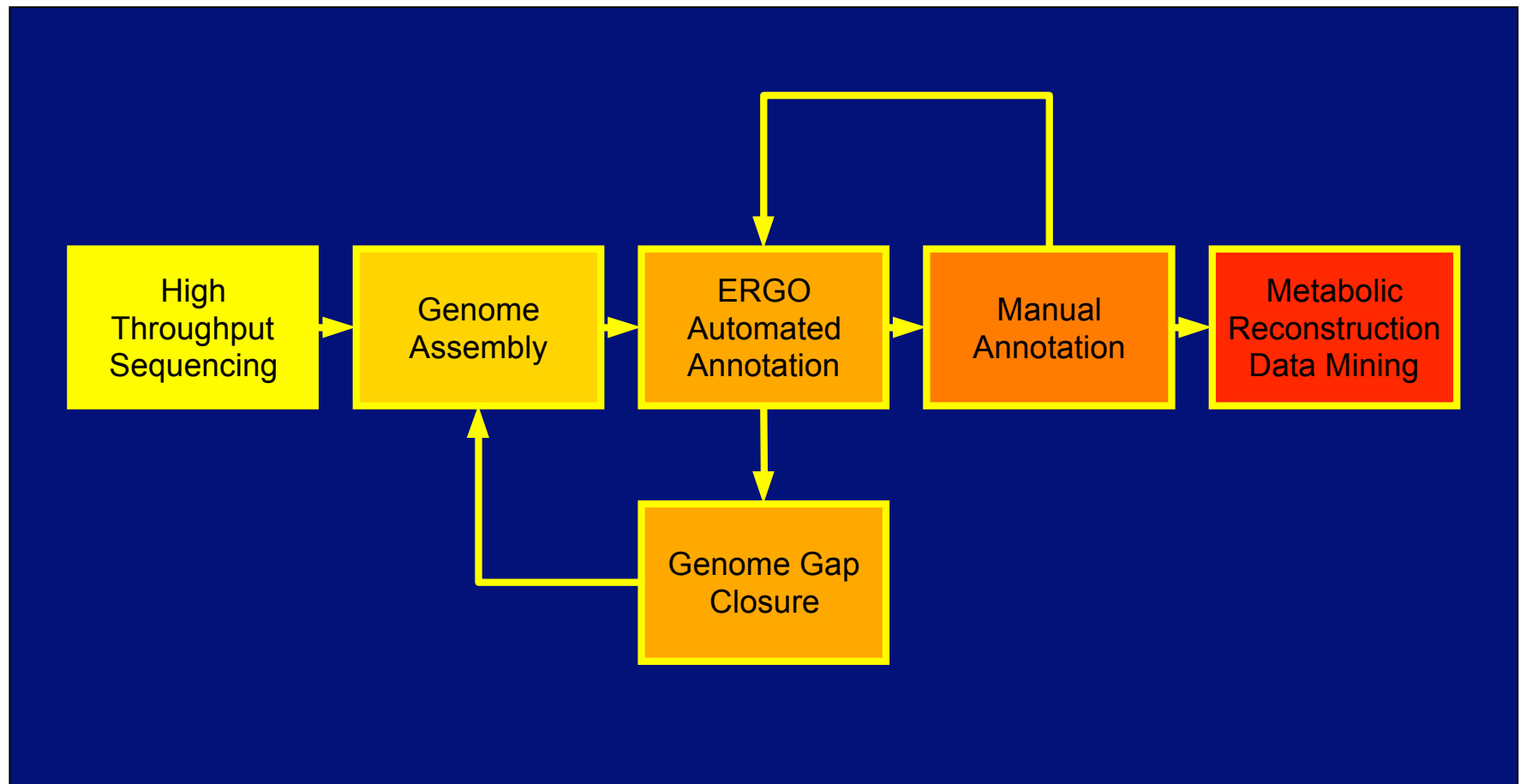
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Integrated Genomics, Inc.
anamitra@integratedgenomics.com**

Agenda

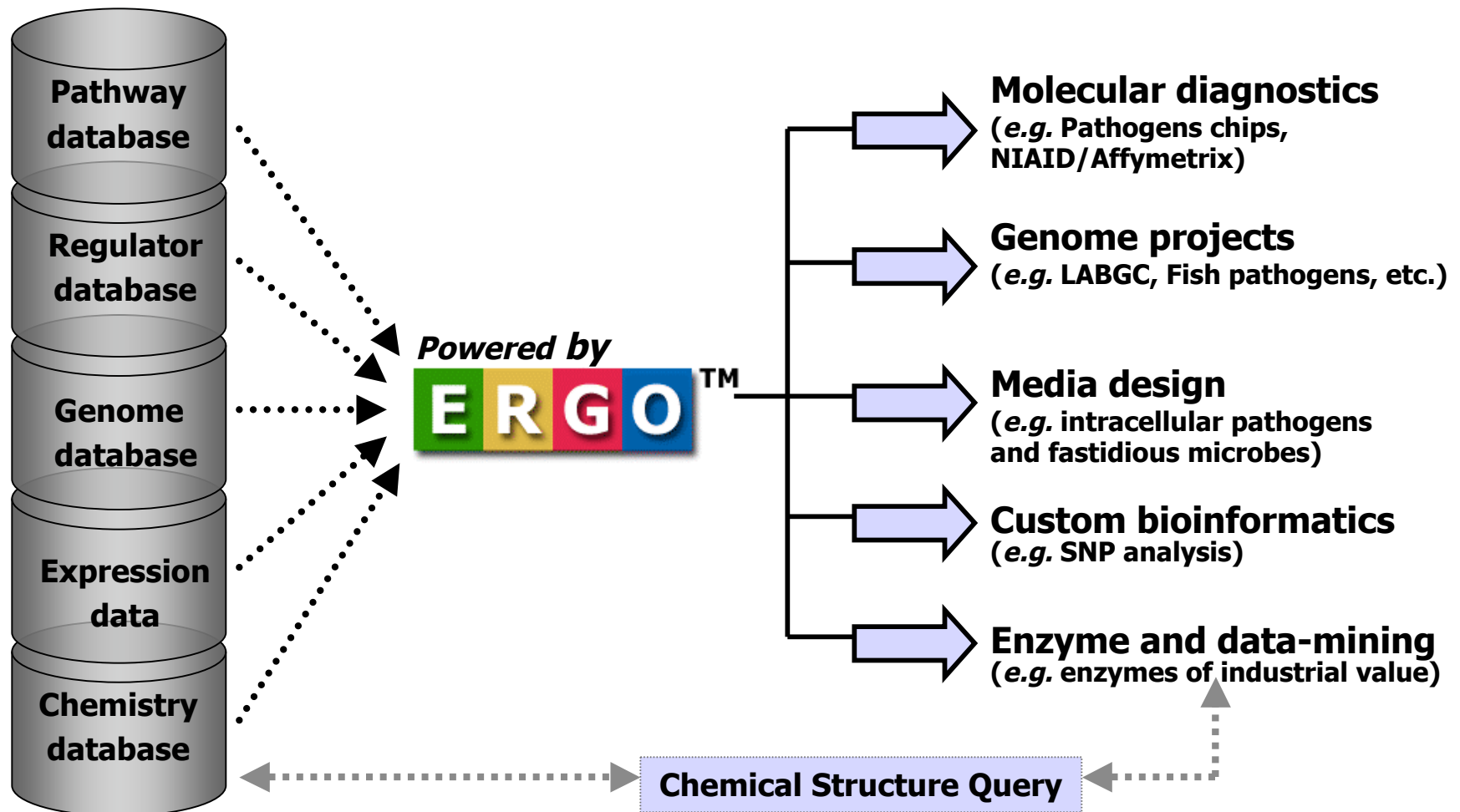
ERGO™ Genome Analysis Platform

- **ERGO Contents, Utilities and Applications**
- **Application Case Study 1: Genome comparison of multiple *Xylella* strains**
- **Application Case Study 2: Genetic basis for phenotypic traits (*Fusobacteria*)**
- **Initial Observations: *R. salmoninarum* genome**

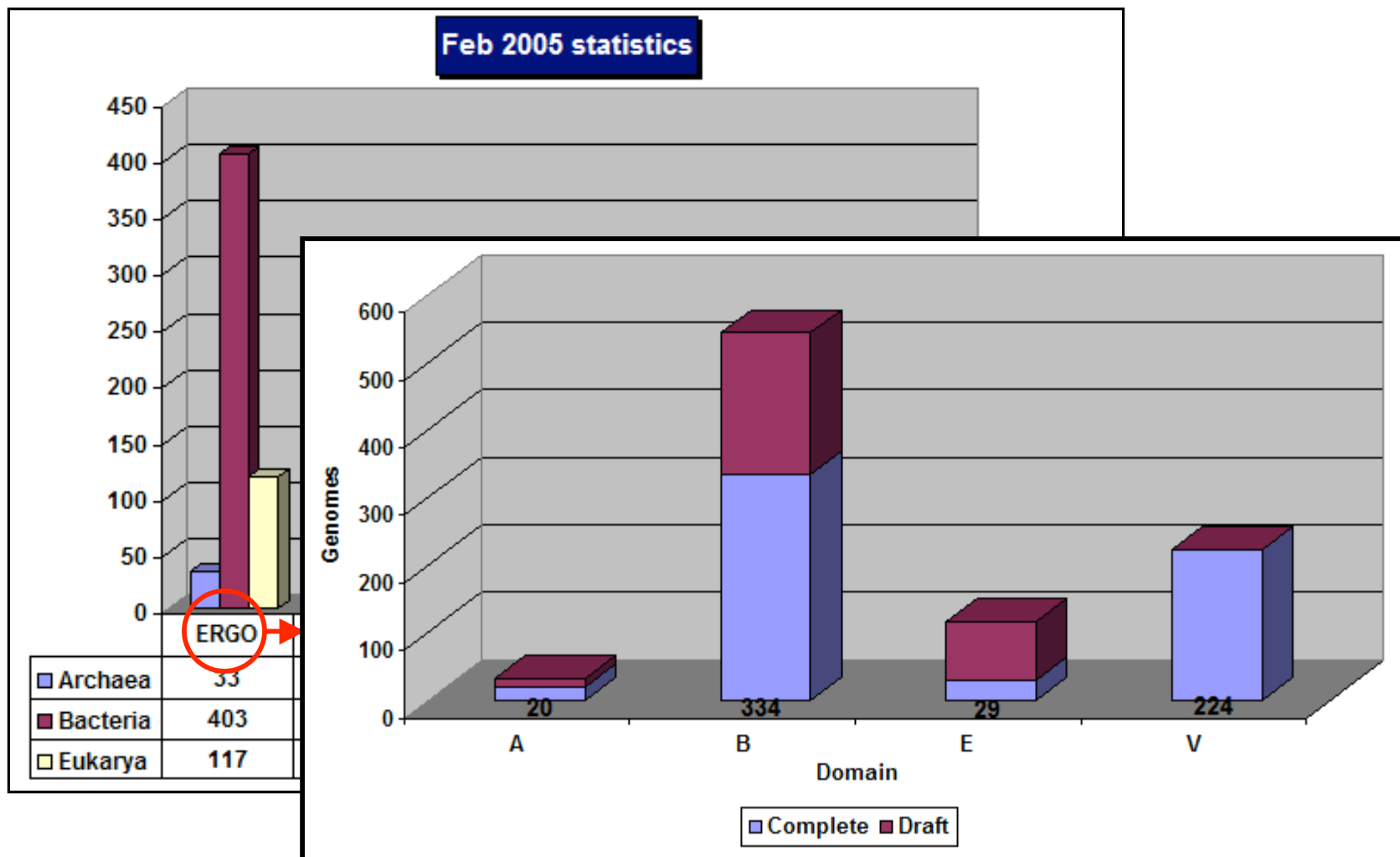
ERGO is Central to Getting the Most Out of a Genome Project



ERGO™ Genome Analysis and Discovery Suite: biological platform for *in silico* analysis



ERGO: largest and diverse genome inventory



ERGO: A Unique Repository of Genomic Data

- Protein-encoding genes:
 - SwissProt: 133,000 carefully curated sequences
 - PIR: 1.1 million less curated sequences
 - GenBank: 1.5 million far less curated sequences
 - **ERGO:** **2.2 million** carefully curated sequences
(in non-redundant protein sequence database)

ERGO curated Protein-encoding genes: 1.4 million sequences

ERGO Statistics

- 850 genomes in the database; 437 bacteria, 129 eukarya
- 2.2 million genes, >60% with detailed annotations
- Association of genes into >6300 metabolic pathways
- Interpretation of microarray data in metabolic context
- Comparative genomics approach: identifies more genes and functions

Manual curation generates highest quality gene annotations

Functional gene assignments: IG vs TIGR

ORGANISM	# Genes	% IG	% TIGR
Brucella suis	3264	70	53
Chlamydia pneumonia AR39	1136	59	43
Chlamydia trachomatis MoPn	928	70	50
Haemophilus influenzae	1846	78	59
Mycobacterium tuberculosis	4473	61	42
Mycoplasma genitalium	532	71	68
Neisseria meningitidis MC58	2329	65	48
Pseudomonas putida	5350	70	65
Streptococcus pneumoniae	2304	73	53
Vibrio cholerae N16961	3915	66	51
Overall	-	68%	53%

ERGO™: compare annotations

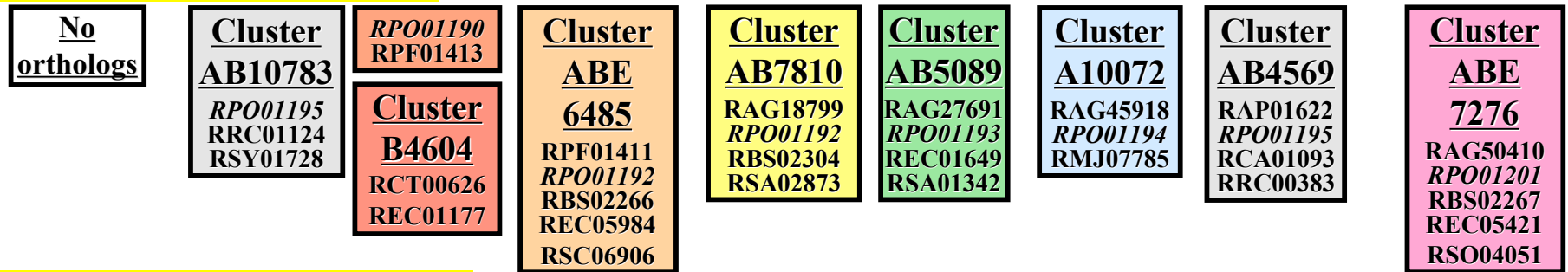
RRSA00029	54	0	NWFSCSam	Partial multiple sugar-binding periplasmic receptor	▶	
RRSA00030	169	0	BlakeNA_OSU	Hypothetical protein	▶	
RRSA00030	169	0	NWFSCSam	Predicted membrane protein	▶	
RRSA00031	387	0	COGs	ABC-type xylose transport system, periplasmic component	▶	Multiple sugar-binding protein chvE
RRSA00031	387	0	Pfam	Periplasmic binding proteins and sugar binding domain of the LacI family	▶	Multiple sugar-binding protein chvE
RRSA00032		0	BlakeNA_OSU	Hypothetical protein	▶	L-arabinose transport system permease protein
RRSA00033		0	NWFSCDonald	truncated IS994 (frame 2)	▶	Transposase
RRSA00033		0	Pfam	Integrase core domain	▶	Transposase
RRSA00034	56	0	BlakeNA_OSU	Hypothetical protein	▶	
RRSA00034	56	0	NWFSCSam	Predicted membrane protein	▶	
RRSA00035	126	0	BlakeNA_OSU	Hypothetical protein	▶	
RRSA00035	126	0	NWFSCSam	Partial serine protease, trypsin family	▶	
RRSA00036	266	0	COGs	ABC-type dipeptide/oligopeptide/nickel transport systems, permease components	▶	Dipeptide transport system permease protein dppC
RRSA00036	266	0	Pfam	Binding-protein-dependent transport system inner membrane component	▶	Dipeptide transport system permease protein dppC
RRSA00037	189	0	COGs	ABC-type dipeptide/oligopeptide/nickel transport systems, permease components	▶	Dipeptide transport system permease protein dppB
RRSA00037	189	0	Pfam	Binding-protein-dependent transport system inner membrane component	▶	Dipeptide transport system permease protein dppB
RRSA00038	56	0	BlakeNA_OSU	Truncated dipeptide transport system protein	▶	
RRSA00038	56	0	NWFSCSam	Partial dipeptide transport system permease protein	▶	
RRSA00039	121	0	COGs	Transposase and inactivated derivatives	▶	Transposase
RRSA00039	121	0	NWFSCDonald	IS994 (orfA)	▶	Transposase
RRSA00039	121	0	Pfam	Transposase	▶	Transposase
RRSA00040		0	NWFSCDonald	truncated IS994 (frame 1)	▶	Transposase
RRSA00040		0	Pfam	Integrase core domain	▶	Transposase
RRSA00041		0	BlakeNA_OSU	Hypothetical protein	▶	
RRSA00041		0	NWFSCSam	Partial alkaline phosphatase	▶	
RRSA00042	297	0	COGs	Pseudouridylate synthase	▶	tRNA pseudouridine synthase A (EC 4.2.1.70)
RRSA00042	297	0	Pfam	tRNA pseudouridine synthase	▶	tRNA pseudouridine synthase A (EC 4.2.1.70)
RRSA00043	239	0	COGs	Ribosomal protein L17	▶	LSU ribosomal protein L17P
RRSA00043	239	0	Pfam	Ribosomal protein L17	▶	LSU ribosomal protein L17P
RRSA00044	218	0	BlakeNA_OSU	Phosphate transport system protein phoU	▶	
RRSA00044	218	0	COGs	Phosphate uptake regulator	▶	
RRSA00044	218	0	NWFSCSam	Phosphate uptake regulator	▶	
RRSA00044	218	0	Pfam	PhoU family	▶	
RRSA00045	395	0	COGs	Signal transduction histidine kinase	▶	Sensor-like histidine kinase senX3 (EC 2.7.3.-)
RRSA00045	395	0	Pfam	Histidine kinase-, DNA gyrase B-, and HSP90-like ATPase His Kinase A (phosphoacceptor) domain	▶	Sensor-like histidine kinase senX3 (EC 2.7.3.-)

ERGO™: Reconstruction steps

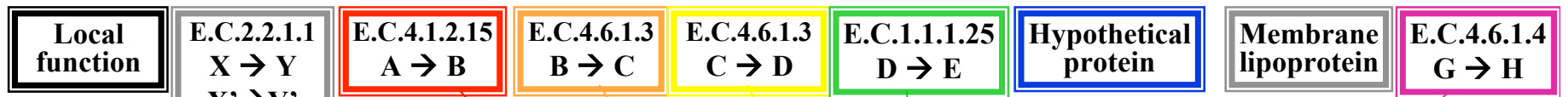
1. ORF PREDICTION



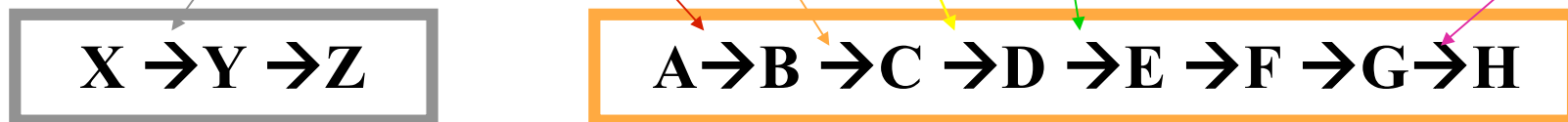
2. PROTEIN CLUSTERS



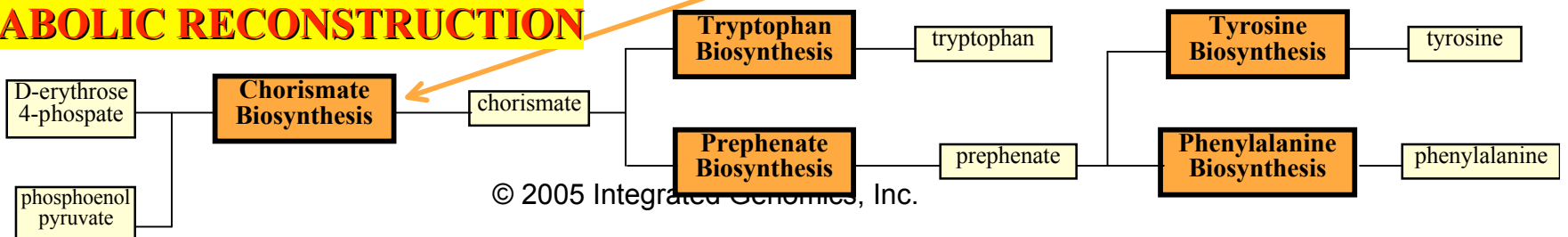
3. FUNCTION PREDICTION



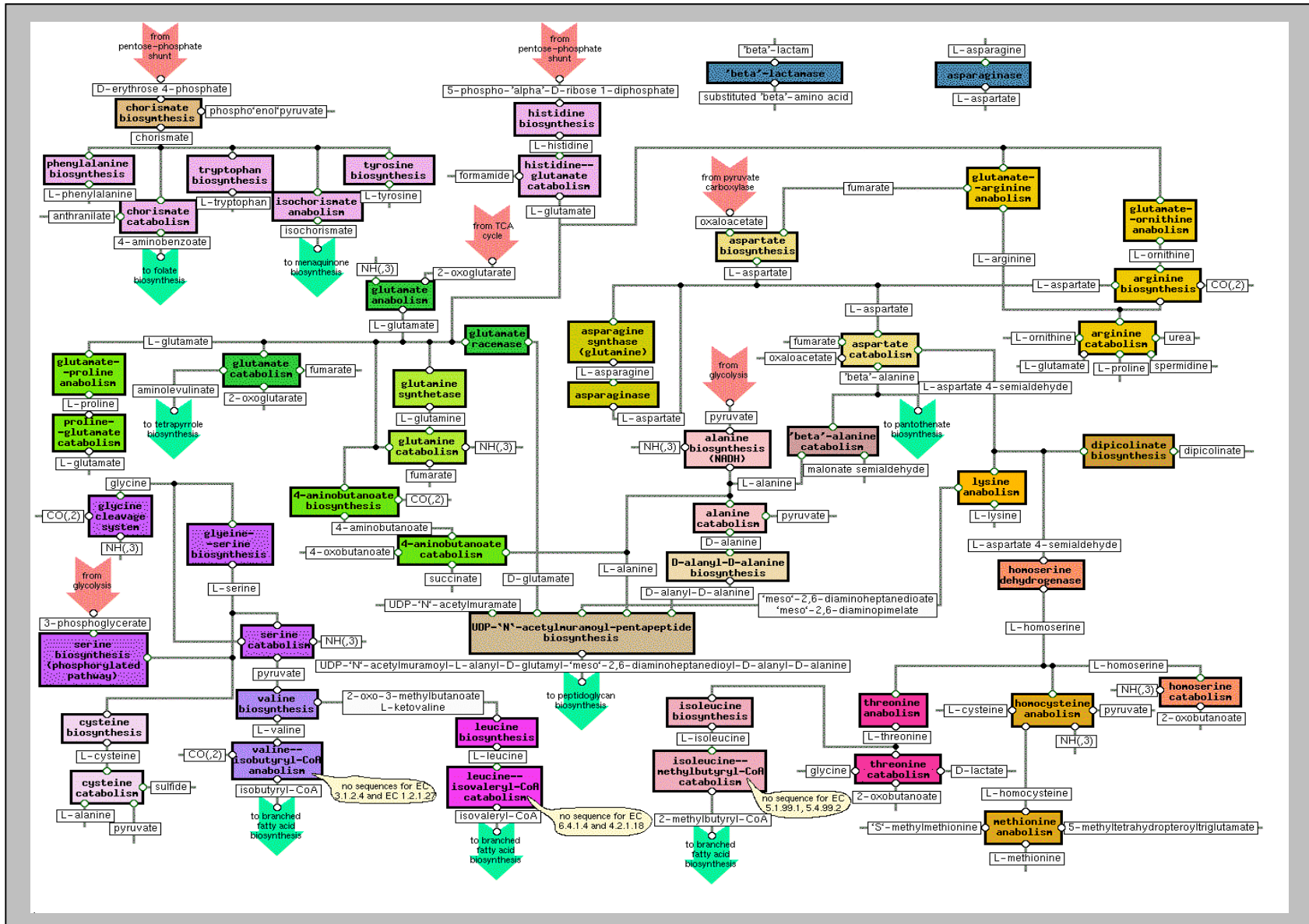
4. PATHWAY ASSERTION



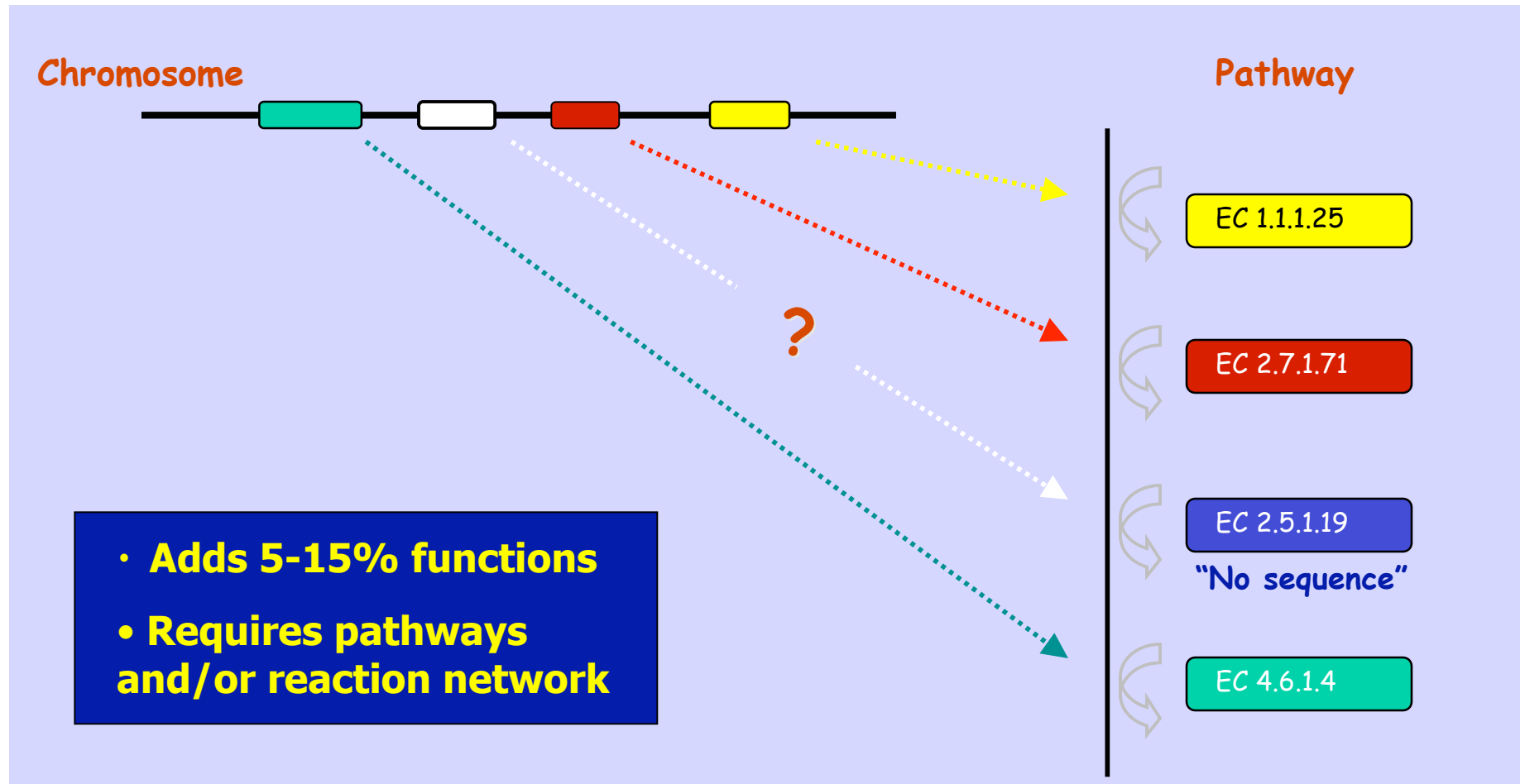
5. METABOLIC RECONSTRUCTION



Functional Reconstruction: a 'road-map'



Pathway Mapping: identification of 'missing genes'



ERGO: Pathway Based Annotations

Pathway Views

[View Annotation](#)

[Diagram Picture](#)

[See Assertions](#)

[See Expression](#)

Pathway MANGDPRHA.ANA ?

Pathway Name mannose--GDPPhamnose_anabolism

Ref. Organism Escherichia coli

in 4 out of 21 Archaea (sorted by name)

18 Assertions in 14 out of 188 Bacteria (sorted by name)

in 0 out of 88 Eukaryota (sorted by name)

Cytosol

?	E.C. #	Functional Description	ORF's Assigned This Function
1	2.7.1.7	MANNOKINASE.	No Sequences
2	5.3.1.8	MANNOSE-6-PHOSPHATE ISOMERASE.	Escherichia coli, 5244 (cpsB) Escherichia coli, 1572 (manA)
3	5.4.2.8	PHOSPHOMANNOMUTASE.	Escherichia coli, 5243 (cpsG) Escherichia coli, 662 (pgm) Escherichia coli, 5862 (mrsA)
4	2.7.7.22	MANNOSE-1-PHOSPHATE GUANYLYLTRANSFERASE (GDP).	Escherichia coli, 5244 (cpsB)
5	4.2.1.47	GDP-MANNOSE 4,6-DEHYDRATASE.	Escherichia coli, 5248 (yefA) Escherichia coli, 2204 (b2255)
6	1.1.1.187	GDP-4-DEHYDRO-D-RHAMNOSE REDUCTASE.	

Data Panel Display

Select Data Panel

2. IG tools

Local Blast (NR) – Protein
Local Blast (NR) – DNA
Function Cluster
Function Couplings
Function Tree
Possible Fusion Event
Pinned Regions
Related Pinned Regions
Preserved Operons
Protein Cluster

3. Public tools

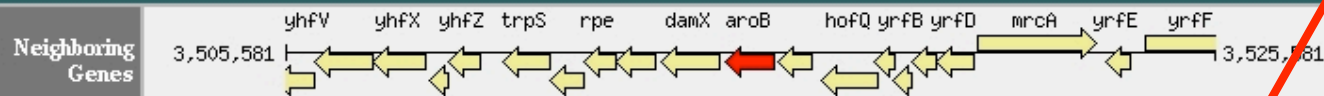
TMPreD
REBASE
ProtScale
PSI-Blast (NR)
RPS-Blast (NR)
EBI NCBI BLAST2
ProSite
ProDom Analysis
Pfam Analysis
EBI InterPro Scan
COG Analysis
CDART Analysis

Primary Information for REC05984 Escherichia coli K12 MG1655

Aliases	aroB; BS-aroB; b3389; gil16131267; gil1789791; gil40968; gil41225; gil606323; gil809694; splP07639; pimrINP00702298
Contig Location	Escherichia_coli_K12 from 3,516,124 to 3,515,039; contig length = 4,639,221 bp
AA Residues, DNA	362 aa, 1,086 bp
Molecular Weight	38,880 Da
Iso-electric Point	5.93
GC content	54.33%, entire genome value = 50.79%, difference = +3.54%
Function	3-dehydroquinate synthase (EC 4.6.1.3)
Protein Cluster	Sugar transport system permease protein
EC 4.6.1.3 Links	Enzyme Commission ExPASy KEGG Maps

1. Local information

Contig Region for REC05984



Pathway Information for REC05984

External Annotations for REC05984

Essentiality

☒ Annotate REC05984

Similarities between REC05984 and Proteins (internal IDs) from All Organisms (60 shown, out

4. Similarities to all other ORFs

View: PClusters (all) || PClusters (internal IDs) || Proteins (all) || Proteins (internal IDs) || Proteins (external IDs)

Configure

Select All

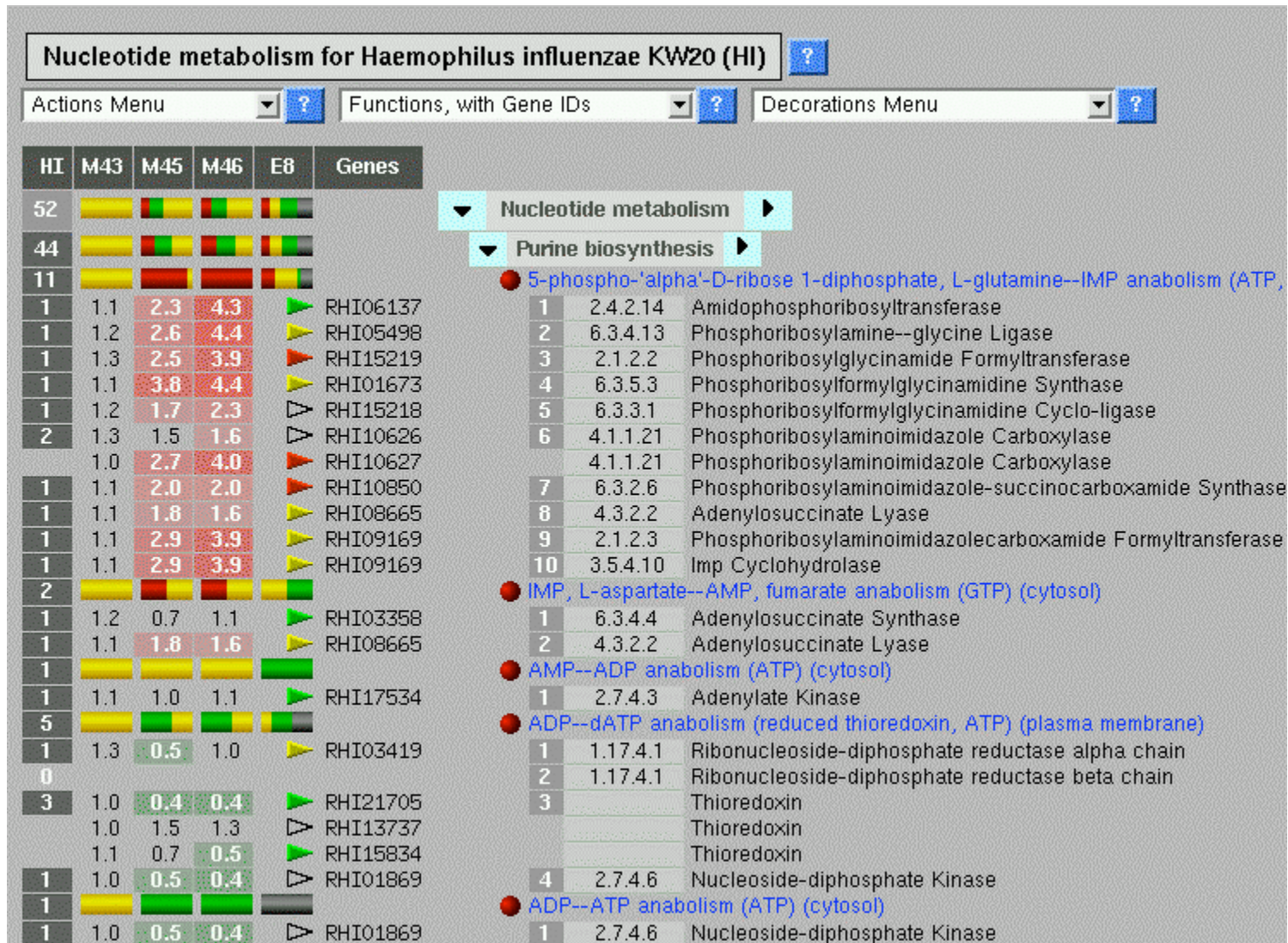
De-select All

Toggle Selection

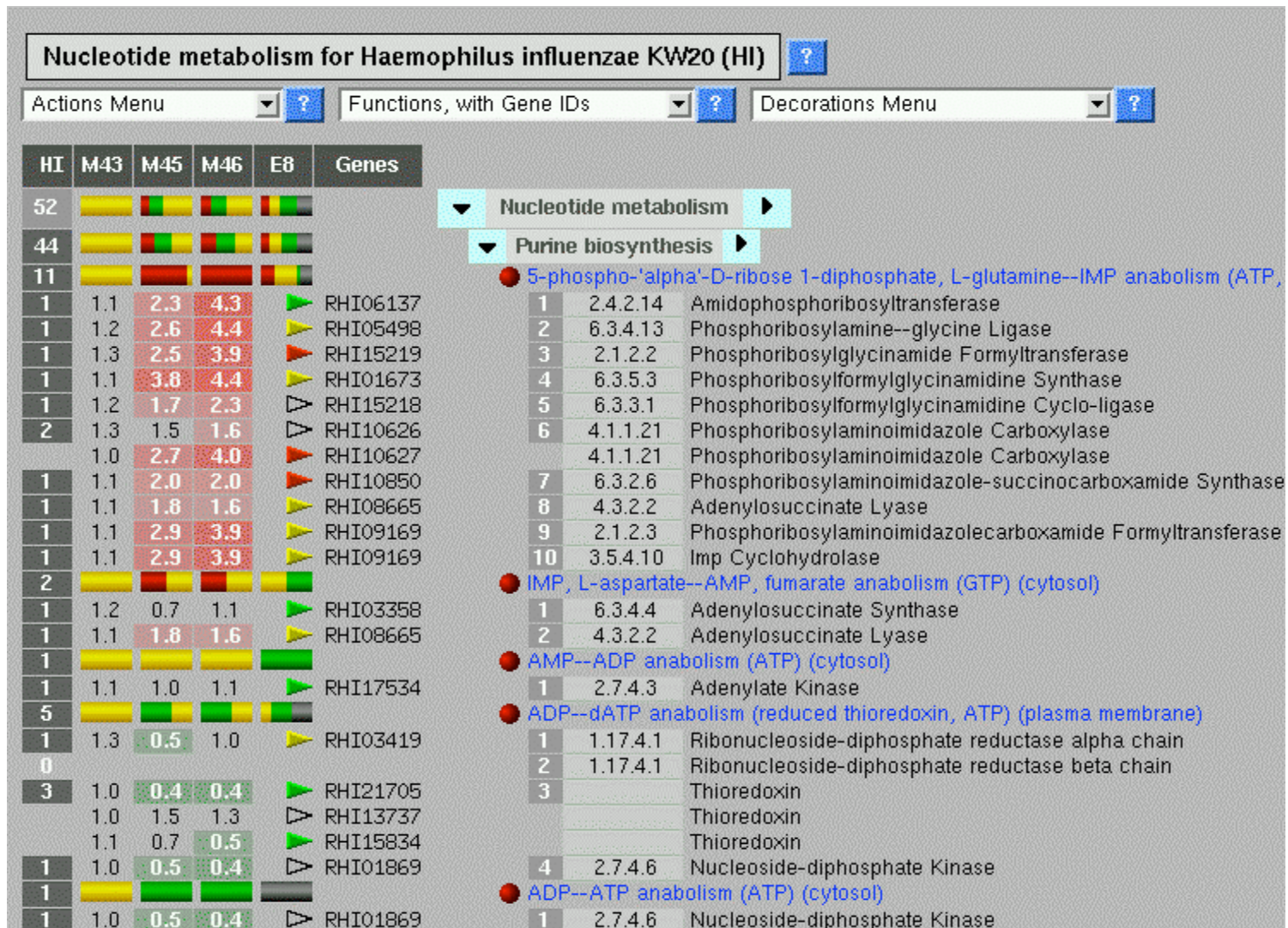
☒ assigns function to all checked ORFs

Switch Groups

Integration of Gene Expression Data with Functional Overviews



Integration of Essentiality Data on Functional Overviews



Case study 1: *Xylella fastidiosa*

Comparative genomics and metabolic reconstruction applied to strain analysis

Collaborators:

U.S. Department of Energy (Joint Genome Institute)
University of California, Berkeley

References:

Bhattacharyya *et al* (2002) *Genome Research* 12:1556-1563

Bhattacharyya *et al* (2002) *Proc. Natl. Acad. Sci. USA* 99:12403-8

***Xylella fastidiosa*: background**

- **Plant pathogens**
 - 3 strains sequenced, public genomes
 - *Xf* pv. citrus, *Xf* pv. almond, *Xf* pv. oleander
 - *Xf* pv. citrus (complete),
 - *Xf* pv. almond, *Xf* pv. oleander (10x draft)
- **Annotation**
 - Manual annotation and database curation
- **Pathway assertion**
- **Genome comparison (3 organisms)**
- **Metabolic reconstruction**
 - Predict physiology based on metabolic potential

Prediction of Growth Medium Components for *Xylella fastidiosa*

Challenge:

- *X. fastidiosa* grows very slowly
- Standard growth medium contains BSA
- Bacteria form biofilm

Solution:

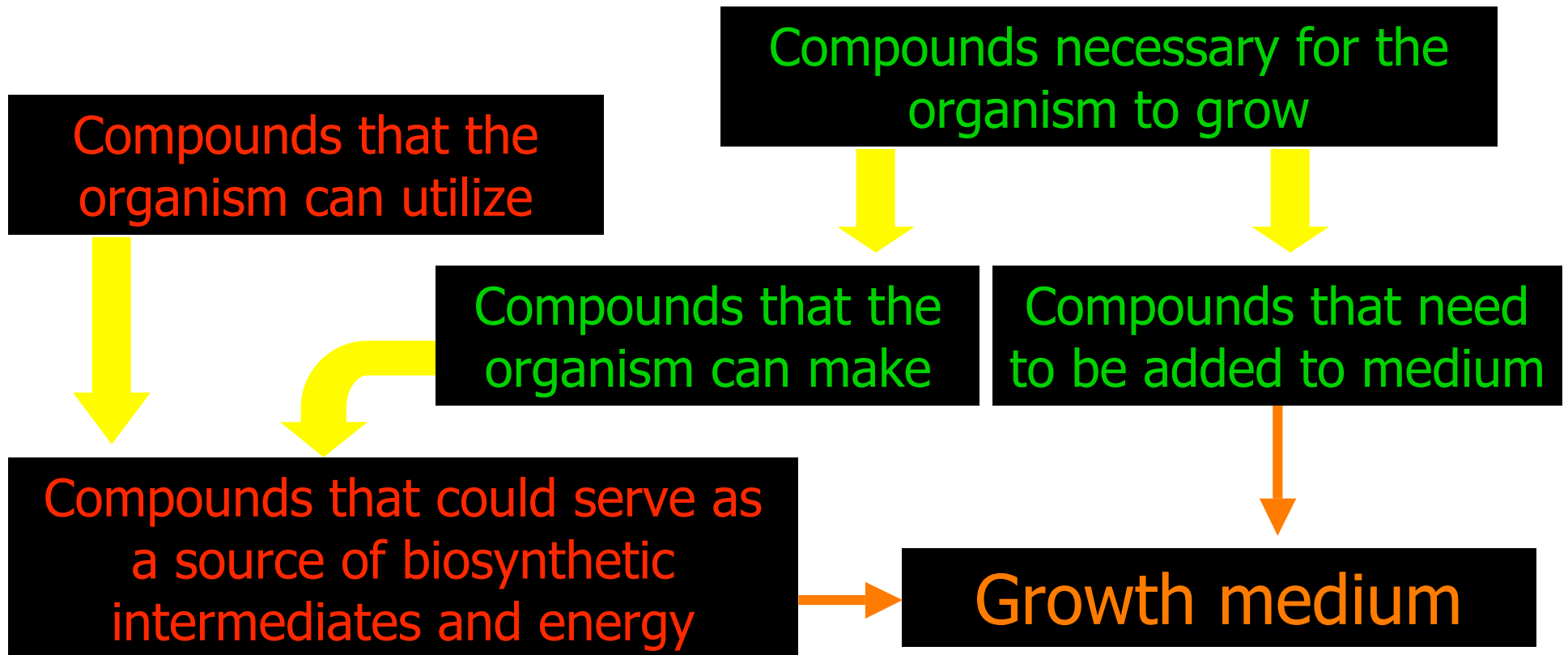
- Growth medium to accelerate *X. fastidiosa* growth *OR*
- Growth medium without BSA to prevent biofilm formation

Requires comprehensive collection of metabolic pathways for uptake and degradation of various compounds

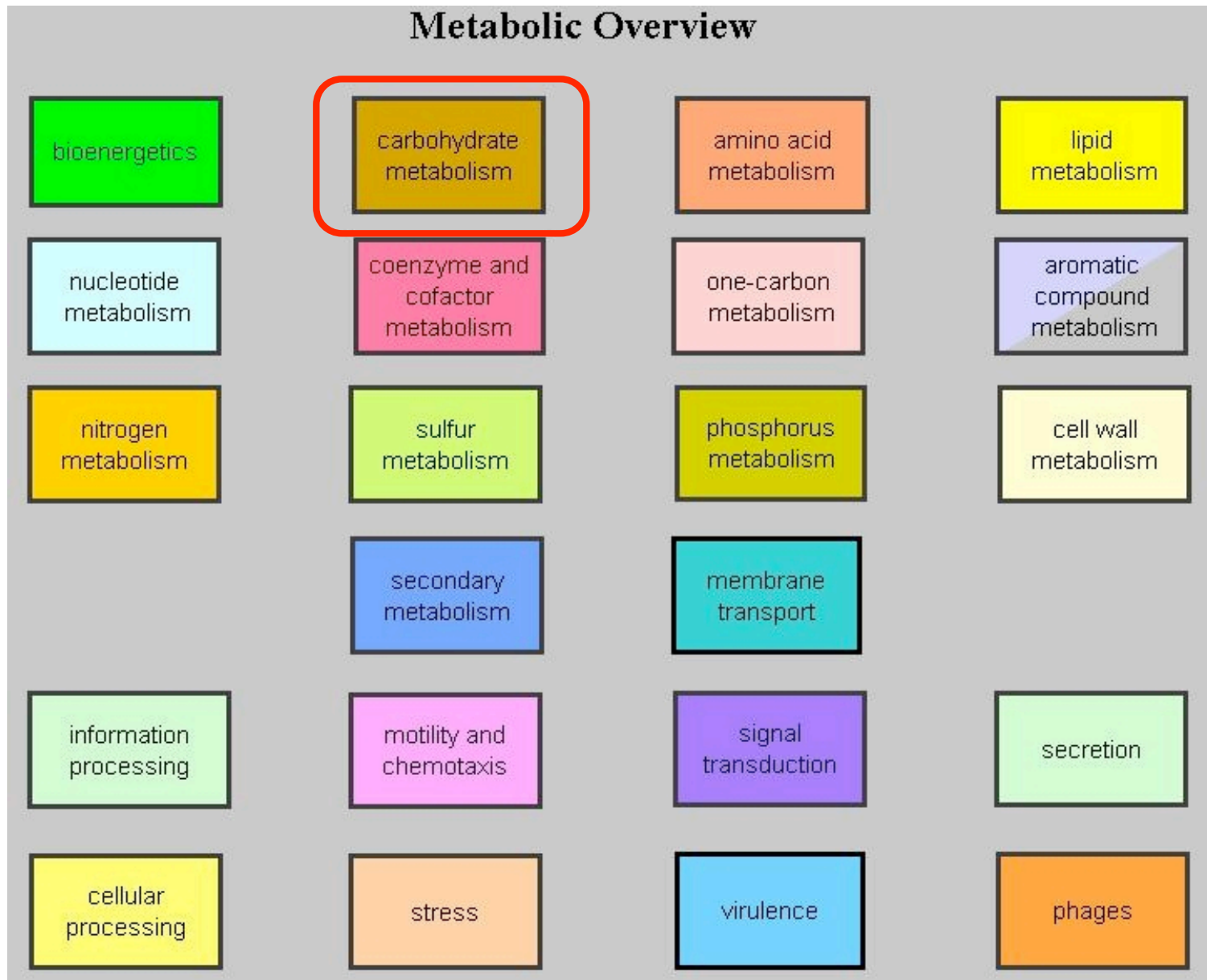
IG's approach:

- Reconstruction of *X. fastidiosa* metabolism
- Identification of potential growth substrates

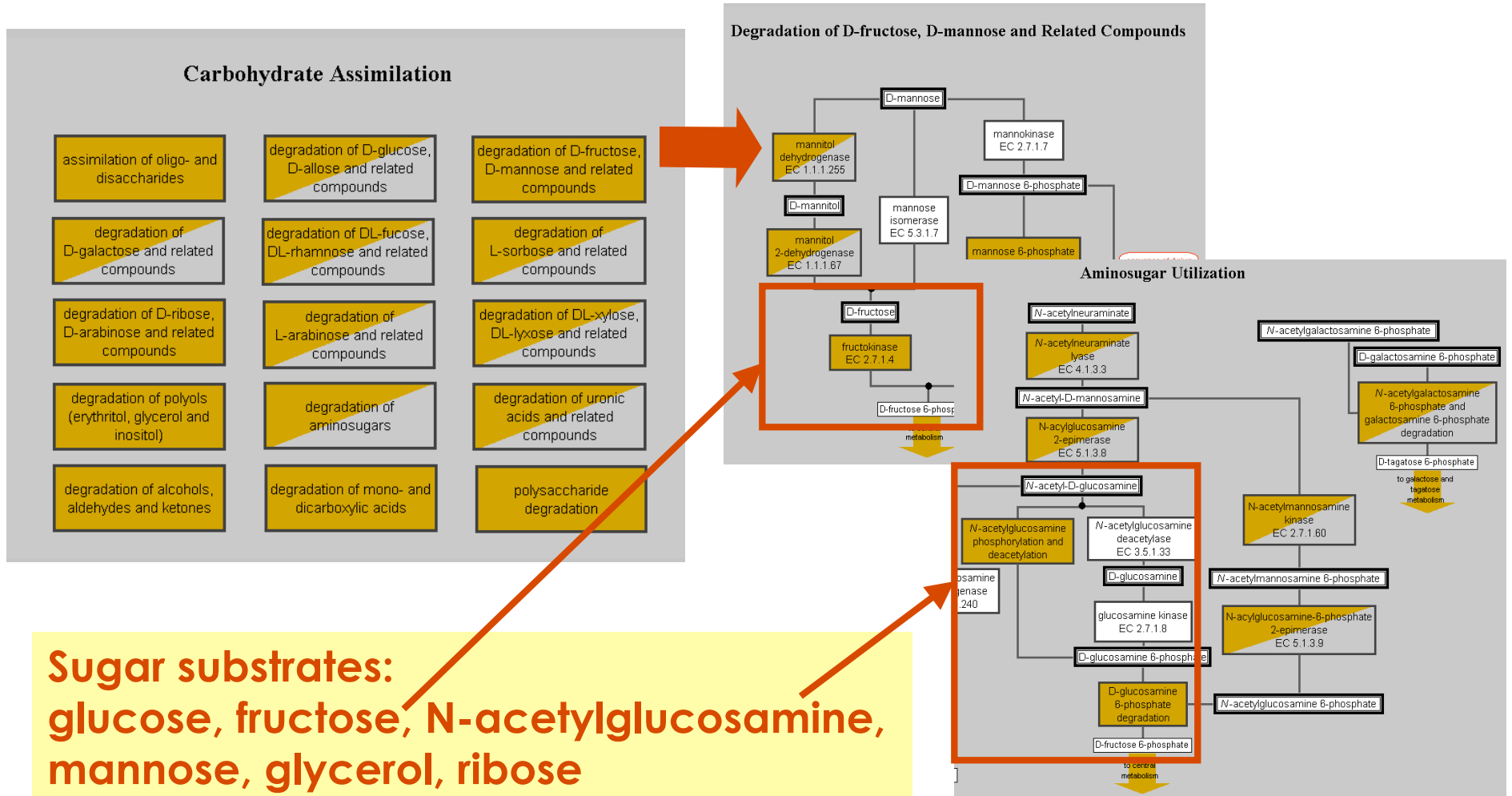
Design of Growth Media: comparative genomics and functional reconstruction



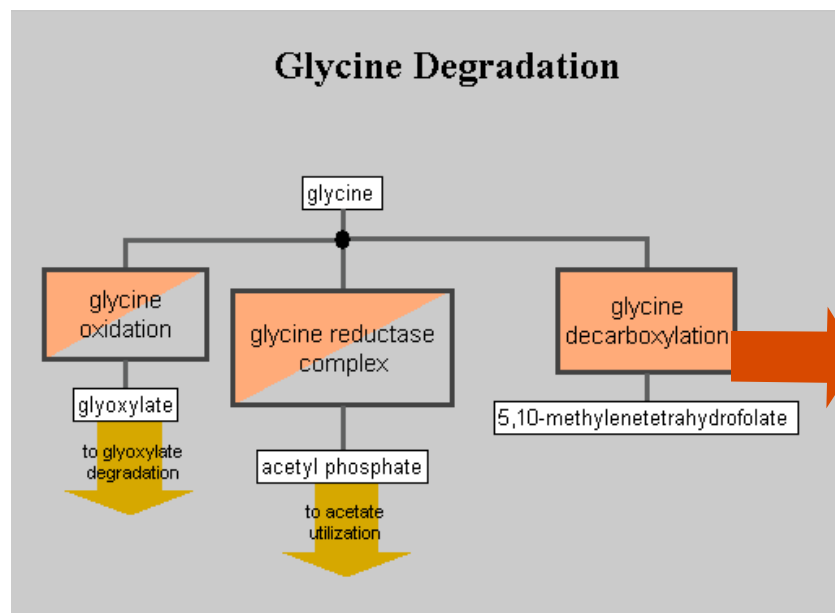
ERGO: Functional overview



Analysis of potential growth substrates for *X. fastidiosa*



Identification of amino acid substrates for *X. fastidiosa*



Pathway page ? Configure Page Save Page

Current organism group: *All Organisms*

Switch Groups

Pathway Views

- [Diagram Picture](#)
- [See Assertions](#)
- [See Asserted Reactions](#)

Curate Pathway

- [Add Annotation](#)
- Asserted
- [Delete for Ref. Org.](#)
- [Suppr. for Ref. Org.](#)

Pathway: GLYNH3PLM.CAT ?

Pathway Name: glycine--NH(3) catabolism (tetrahydrofolate, lipoylprotein) (plasma membrane)

Ref. Organism: *Xylella fastidiosa* CVC

Function Tree: [Display pathway in the context of sub-systems](#)

189 Assertions

Best KEGG Maps: [Glycine, serine and threonine metabolism](#)

?	E.C. #	Functional Description	ORF's assigned this function
1	1.4.4.2	Glycine dehydrogenase (decarboxylating)	RXFA01385 (XF1385) pin
2	2.1.2.10	Aminomethyltransferase	RXFA01068 (XF1068) pin RXFA00183 (XF0183) pin

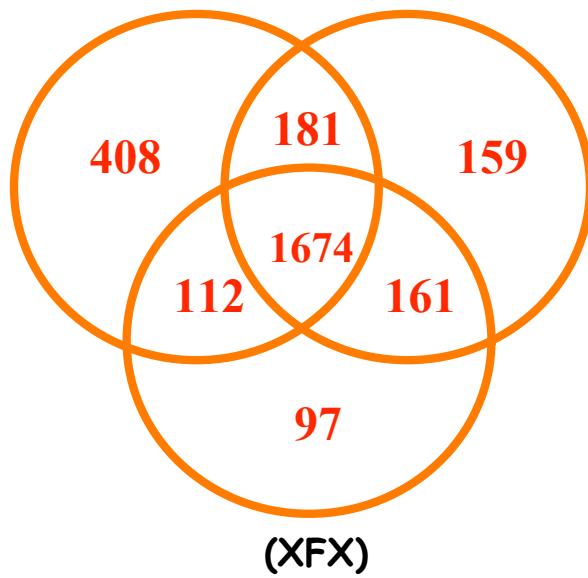
Amino acid substrates:
glycine, L-glutamate (2-ketoglutarate),
D- and L-alanine

Result: successful design of growth medium for *X. fastidiosa*

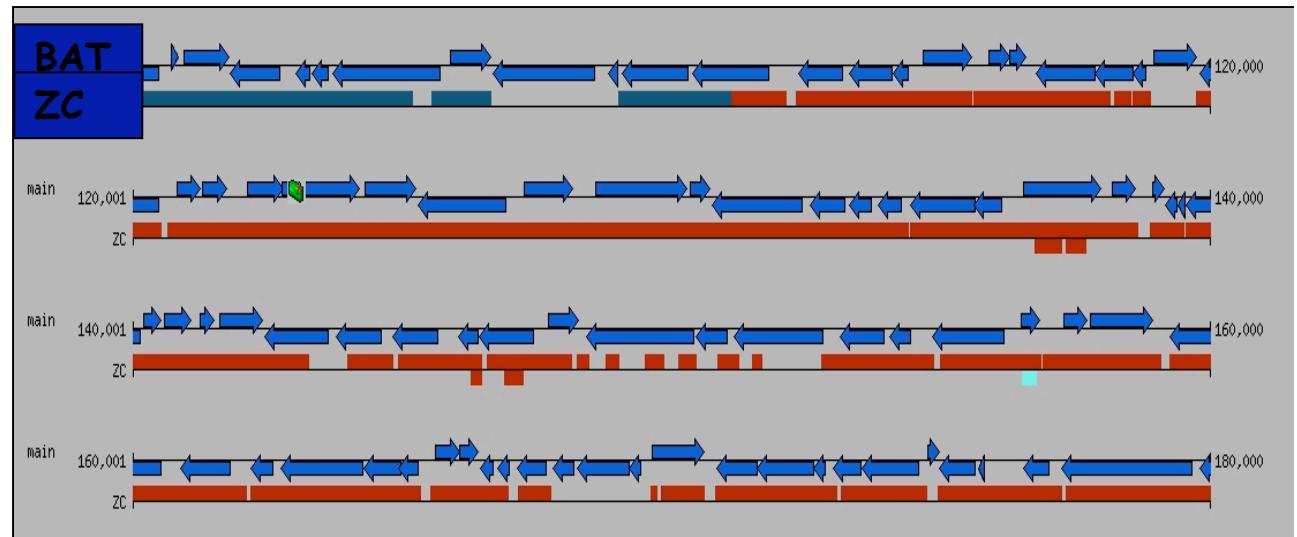
Medium	Growth, CFU
Standard PW (contains BSA)	1.13×10^9
Standard PW - BSA	no growth
Standard PW - BSA + fructose	8.4×10^9
Standard PW - BSA + fructose + glycine + L-alanine	9.5×10^9

Genome Comparisons: tools

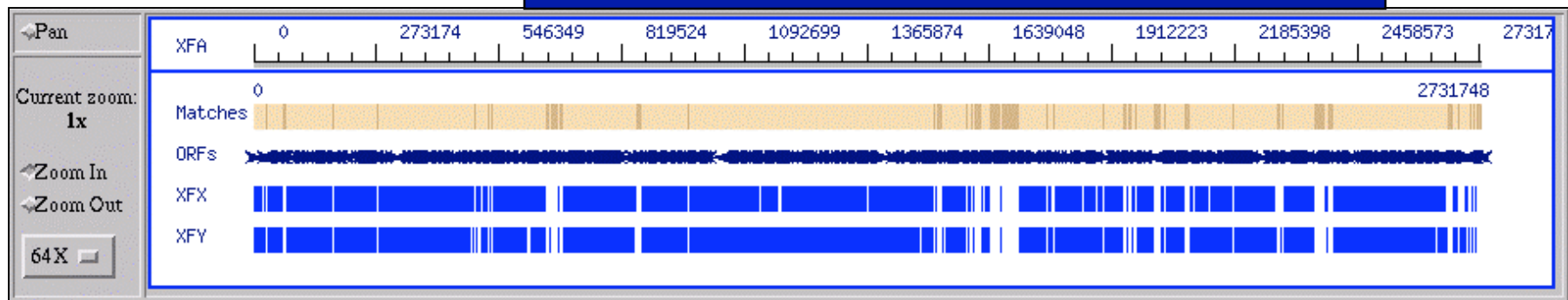
WorkBench: protein clustering



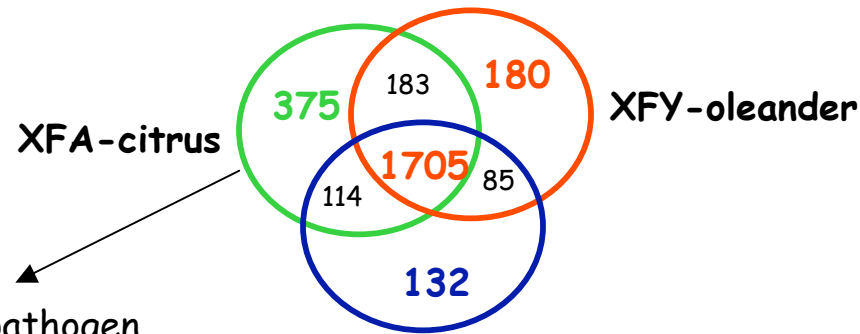
GenomeAlign: genomic DNA alignment



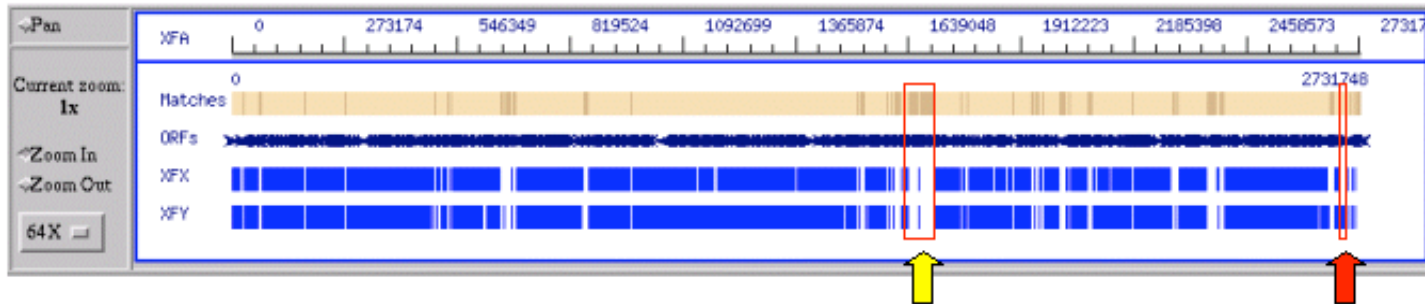
GenomeWalk: proteome alignment



Strain Comparisons: Protein clusters



Unique for the citrus pathogen
Of these, 54% not seen anywhere else
Includes a phage insertion



Phage insertion with 2 unusual carbon utilization operons
conferring host specificity to grow in citrus

Case study 2: *Fusobacterium nucleatum*

Identification of genetic determinants of phenotypic traits (bad oral odor)

References:

Kapatral *et al* (2002) *J. Bact.* 184: 2005-18

F. nucleatum is a “BRIDGE” bacterium

- Over 300 genera and 500 species co-exist in oral cavity
 - Most are commensals but a few are opportunistic pathogens
- Infection process:
 - a) Tooth surface allows pellicle formation
 - b) Early colonizers: *Streptococci*, *Actinomyces spp*
 - c) *Fusobacteria spp.*
 - d) Late colonizers include pathogens:
 - P. gingivalis*, *A. actinomycetemcomitans*
 - T. denticola*, *B. forsythus*
- What is the physiological basis of mal-odour during infection?

Species	Disease
<i>F. nucleatum</i>	Periodontitis
<i>F. necrophorum</i>	Lemierre's Syndrome
<i>F. ulcercans</i>	Skin ulcers
<i>F. russi</i>	Animal bites
<i>F. varium</i>	Eye infections

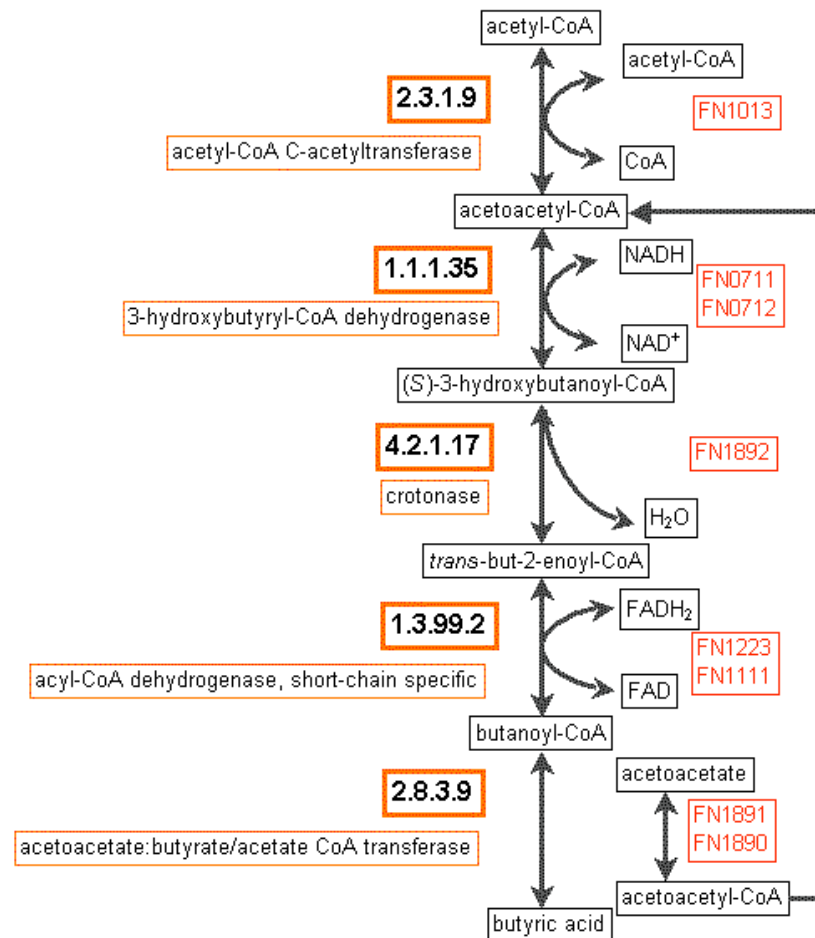


***Fusobacterium*: project schema**

- **Determine genome sequence**
 - Whole genome shotgun sequencing
 - Primer walking to close gaps
 - Assembly
- **Annotation**
 - Automated ORF calling
 - Manual annotation and database curation
 - Identification of operons
- **Pathway assertion**
- **Metabolic reconstruction**
 - Predict physiology based on metabolic potential

What causes the bad smell ?

- Hydrogen sulfide: degradation of cysteine and methionine
- Butyric acid: prevents wound healing



Reconstruction of the entire butyric acid biosynthetic pathway

BKD: Renibacterium salmoninarum

Genome Analysis and Functional Reconstruction: initial observations

Renibacterium: statistics

Statistics for 'Renibacterium salmoninarum (IG-152)' (RSA) ?				
Switch Organisms				
I	S	Data Category	Counts	% of Total
		DNA total sequenced, bases	3,155,294	100.00
		DNA coding sequence, bases	2,870,673	90.98
		DNA G+C content, bases	1,775,527	56.27
		DNA contigs	1	
<input type="checkbox"/>	<input type="checkbox"/>	ORFs total	3,667	100.00
<input type="checkbox"/>	<input type="checkbox"/>	ORFs with assigned function	2,333	63.62
		ORFs with function but no similarities	0	
<input type="checkbox"/>	<input type="checkbox"/>	ORFs without assigned function	1,334	36.38
<input type="checkbox"/>	<input type="checkbox"/>	ORFs without function or similarity	235	6.41
<input type="checkbox"/>	<input type="checkbox"/>	ORFs without function, with similarity	1,099	29.97
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in asserted pathways	1,504	41.01
<input type="checkbox"/>	<input type="checkbox"/>	ORFs not in asserted pathways	2,163	58.99
<input type="checkbox"/>	<input type="checkbox"/>	ORFs with assigned function but no pathway	830	22.63
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in the functional overview	1,870	51.00
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in protein clusters	547	14.92
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in paralog clusters	946	25.80
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in COGs	2,419	65.97
<input type="checkbox"/>	<input type="checkbox"/>	ORFs with Pfam matches	1,952	53.23
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in chromosomal clusters	2,231	60.84
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in possible fusion events	1,568	42.76
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in possible fusion events as composites	360	9.82
<input type="checkbox"/>	<input type="checkbox"/>	ORFs in possible fusion events as components	1,388	37.85
		Functions assigned	1,335	100.00
		Functions assigned, hypothetical	18	1.35
		Functions assigned, connected to asserted pathways	927	69.44
		Functions assigned, not connected to asserted pathways	408	30.56
		Functions missing from asserted pathways	42	
		Functions with no sequence	0	
		Pathways asserted total	1,029	100.00
		Protein clusters, total	426	100.00

After automated assignments

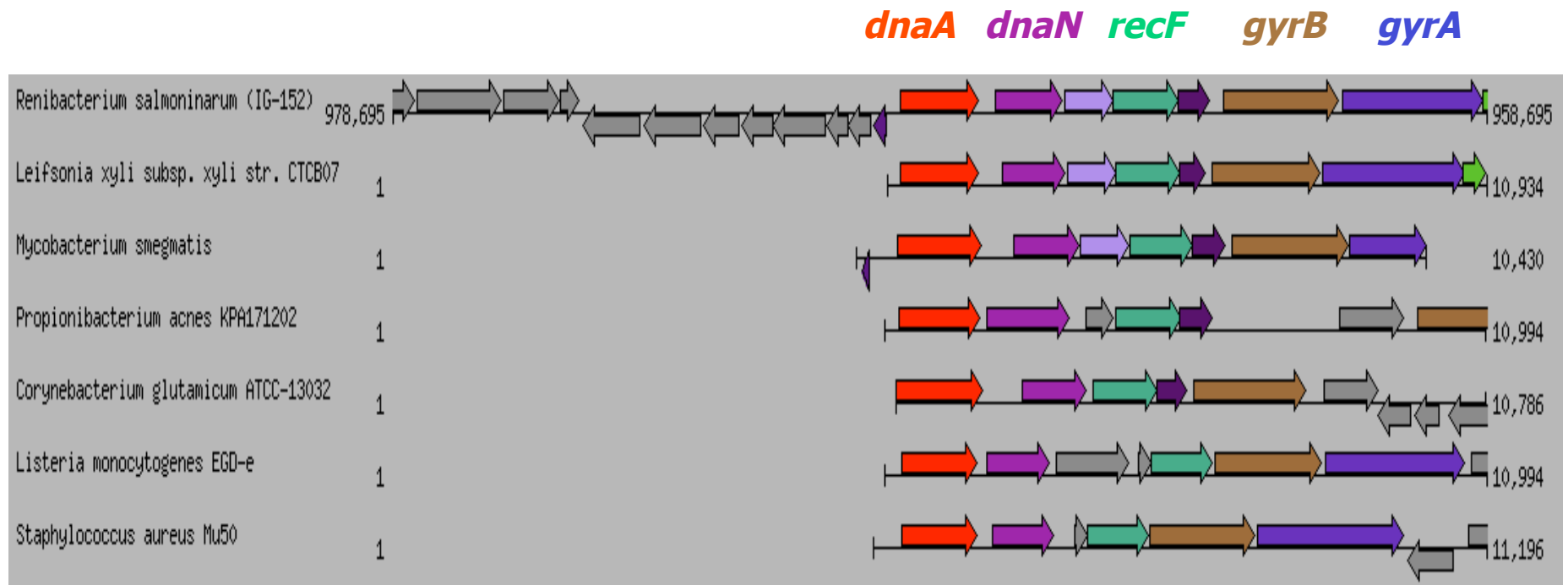
→ 64% assigned functions

→ 66% COGs families

→ 53% Pfam domains

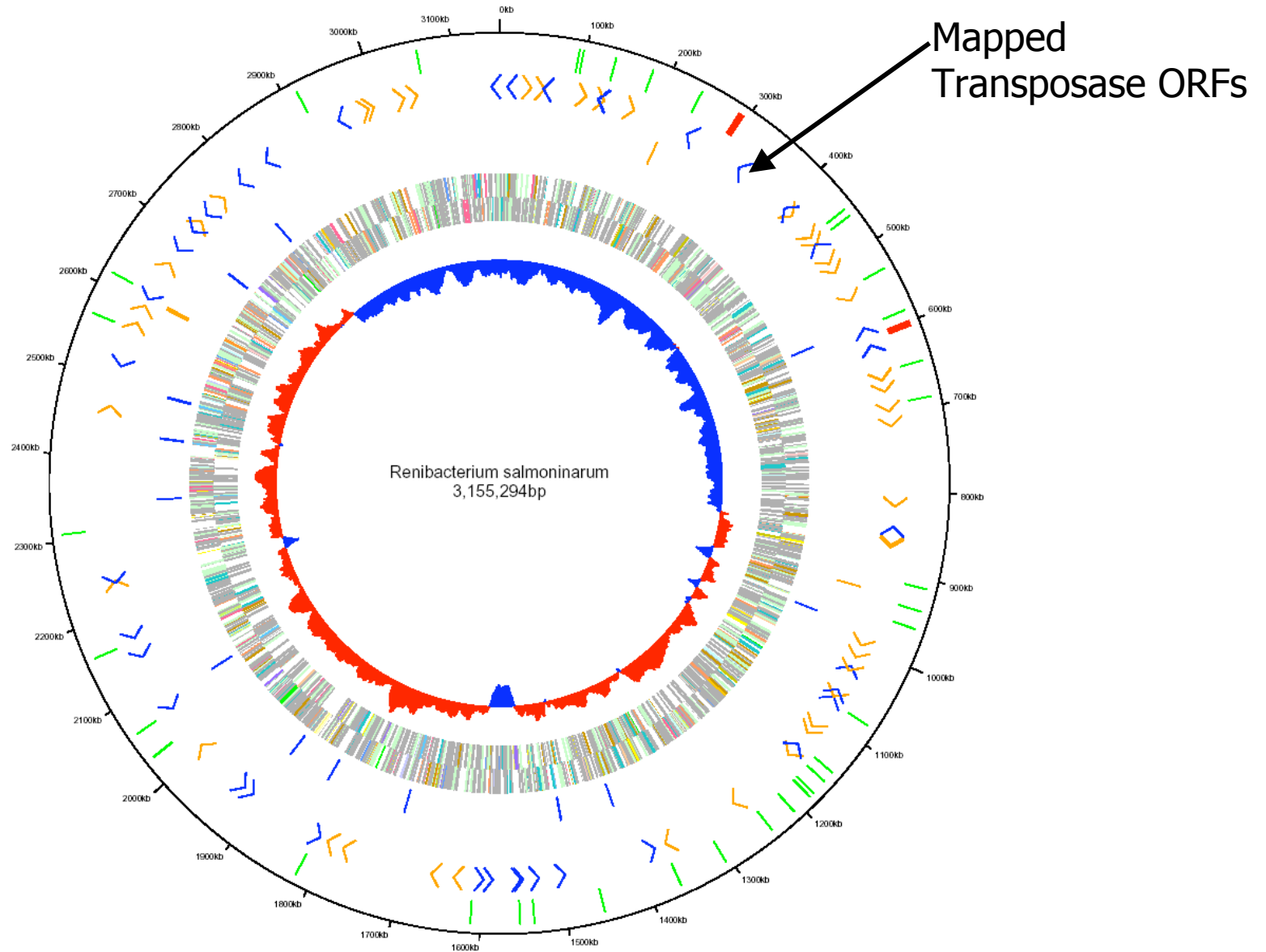
→ 61% clustered ('operons')

Renibacterium: replication origin?

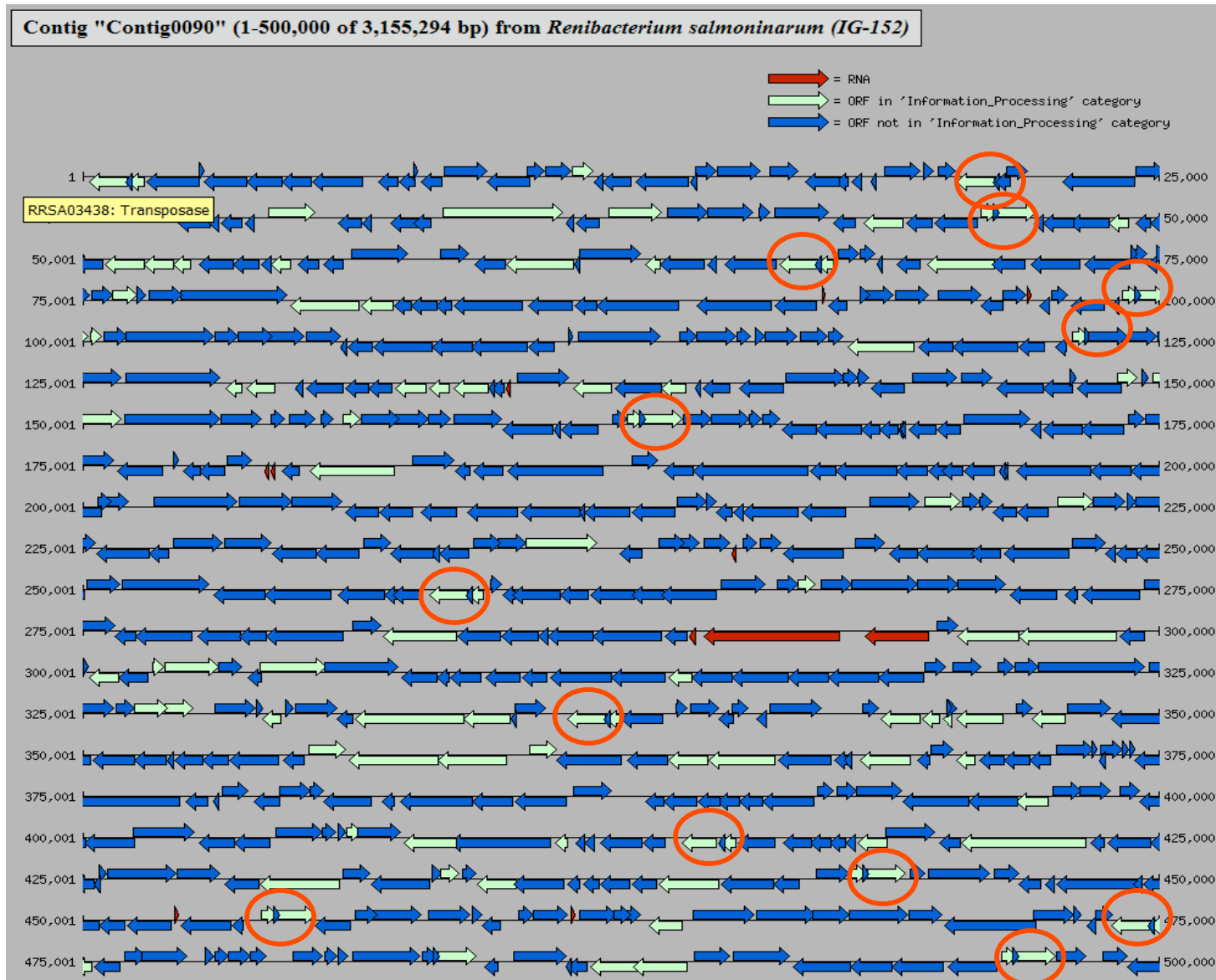


***dnaA* coordinates: begin 969,395; end 967,995**

Renibacterium: genome map



Renibacterium: 'transposases'



***Renibacterium*: central metabolism**

R. salmoninarum possesses classical metabolic pathways for:

- glycolytic pathway (EMP)
- pentose phosphate
- TCA (Krebs) cycle
- pyruvate cycle

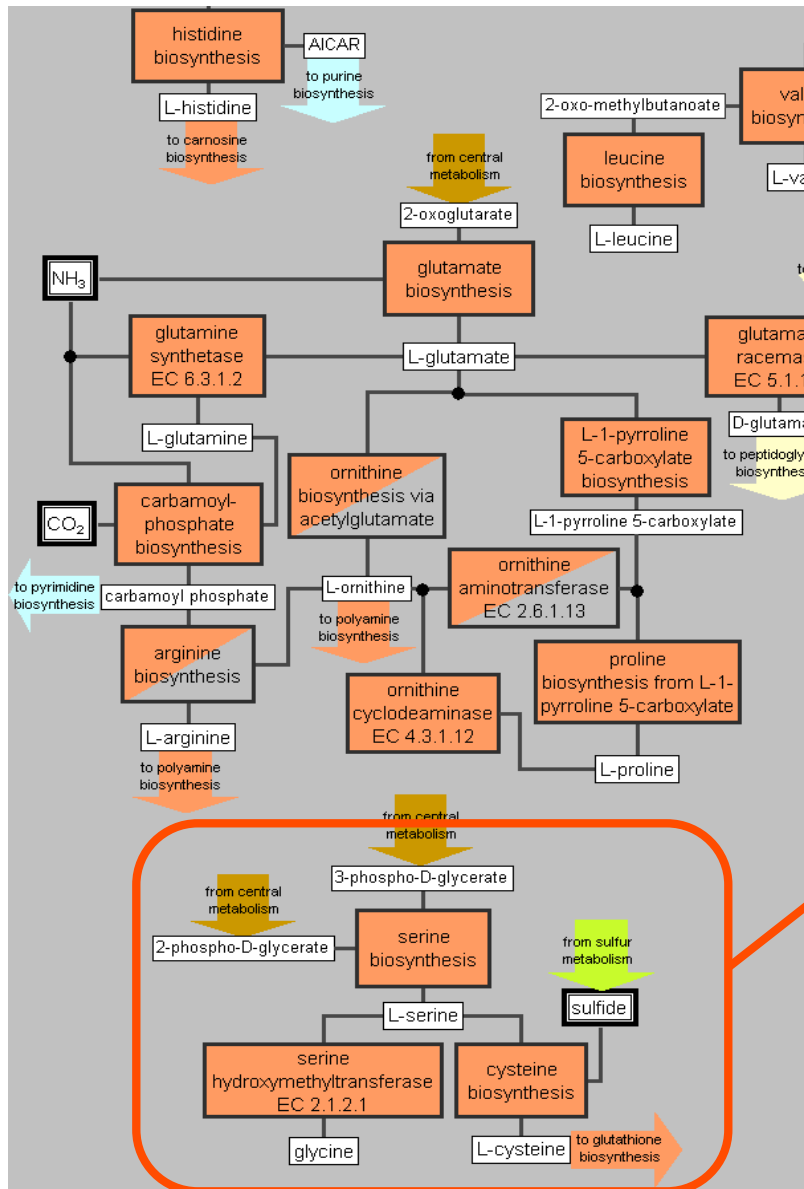
Summary: can utilize many sugars and polyols

R. salmoninarum has limited transporters for sugars/polyols:

- glucose/fructose
- fructose PTS
- glycerol
- gluconate
- arabinose
- C4 dicarboxylate (malate/succinate)

Summary: most likely able to uptake at least fructose, gluconate, glycerol

Renibacterium: amino acid biosynthesis



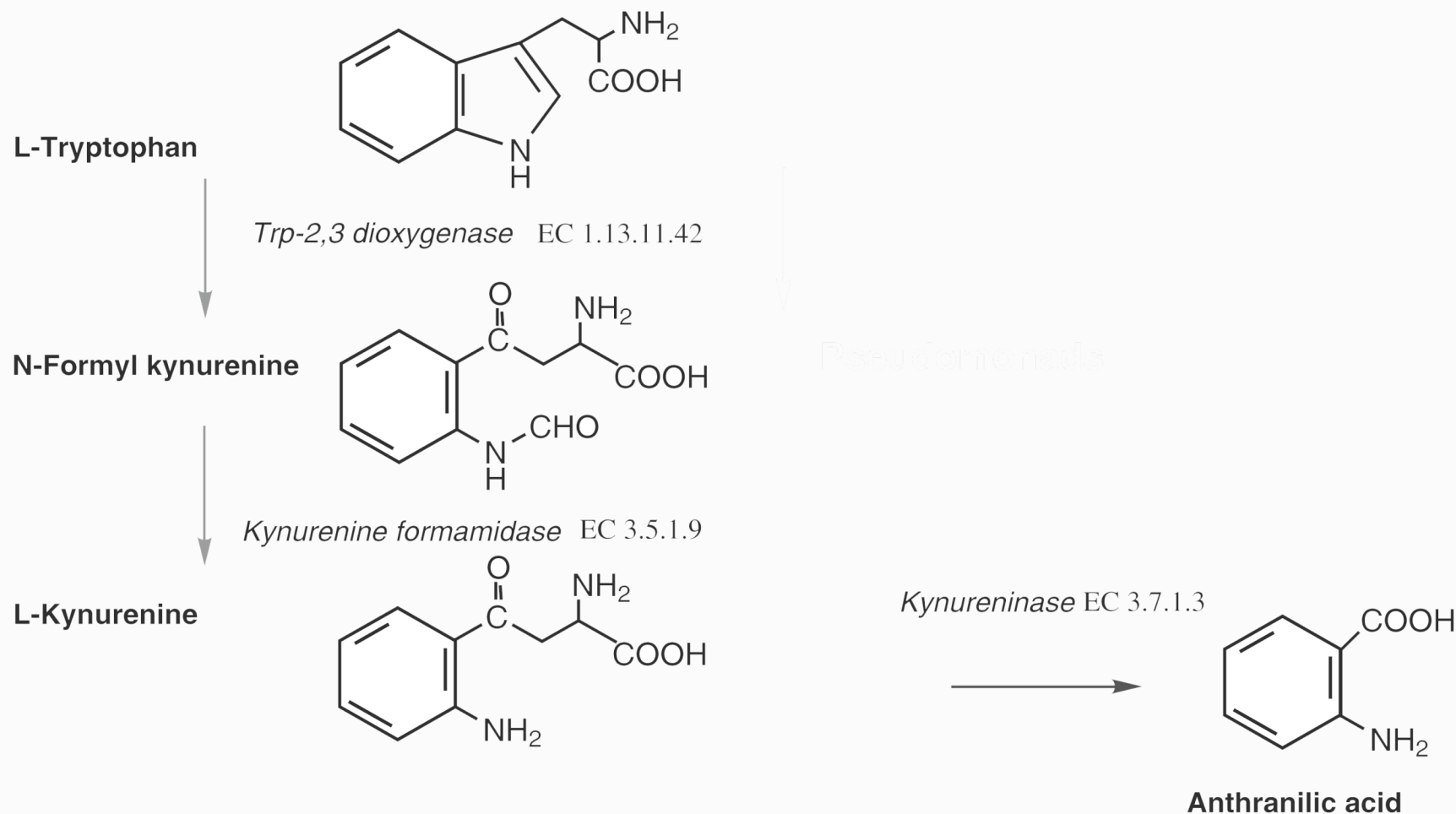
Initial inspection suggests that the bacterium is able to make most amino acids

Question: Bacterium can biosynthesize serine and cysteine. So why is cysteine added to KDM2 medium for *Rsa* growth?

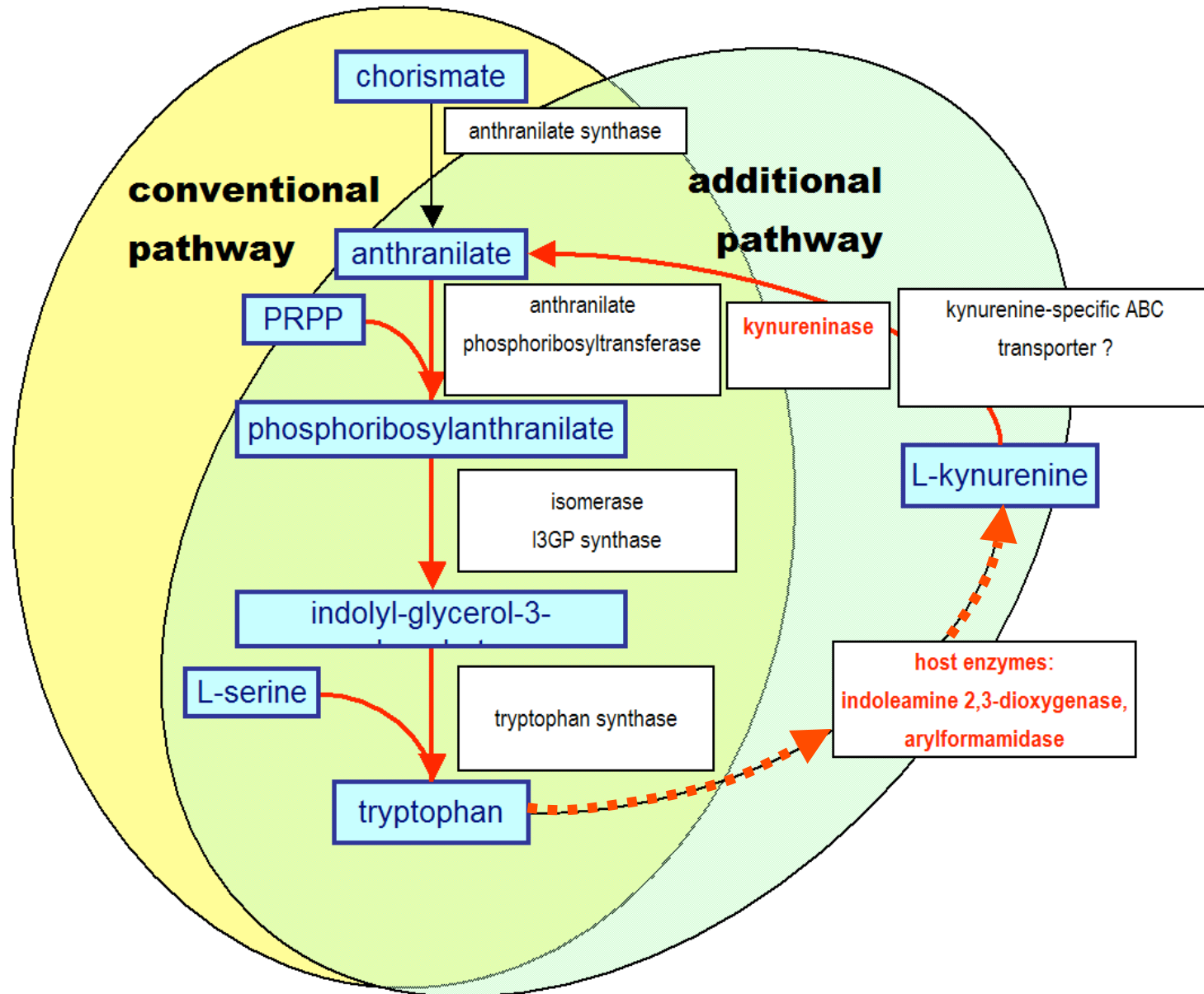
KDM2 media:

yeast extract, peptone, serum or charcoal, 0.05% Cys

Renibacterium: what is L-kynurenine?

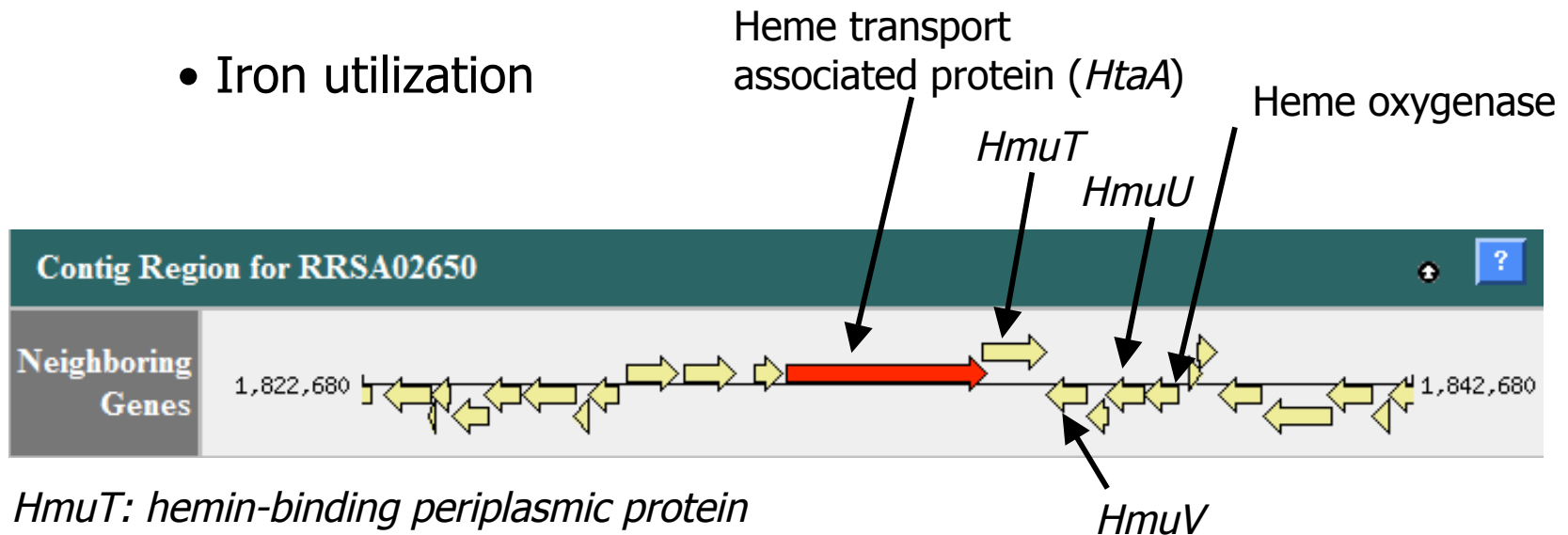


Renibacterium: scavenging host kynurenine?



Renibacterium: iron uptake and oxygen stress

- Iron utilization



HmuT: hemin-binding periplasmic protein

HmuU: hemin transport system permease protein

HmuV: hemin transport system, ATP-binding protein

- Enzymes capable of coping with intracellular oxygen stress
 - superoxide dismutase (RRSA02650)
 - catalase (RRSA00708)
 - thioredoxin peroxidase (RRSA01668)

***Renibacterium*: pathogenicity factors?**

Major cell surface antigen (Msa1, p57)

- Msa1 (RRSA00268, RRSA03467)
- attachment to salmonid erythrocytes

Cell adhesion protein

- hemolysin *tlyA*-related, RRSA01172

Metalloprotease/Hemolysin

- known *Rsa hly* (maps to RRSA01873)

Virulence factor MviN- and MviB-like (*S. typhimurium*)

Chitin and chitosan hydrolyzing enzymes identified

- endochitinase (RRSA06681)
- chitosanase (RRSA00952)
- β -N-acetylhexosaminidase (RRSA01602)
- capable of utilizing N-acetylglucosamine, D-glucosamine and chitobiose

ERGO: selected publications

Complete genome sequence of *Vibrio fischeri*: A symbiotic bacterium with pathogenic congeners

E. G. Ruby^{††}, M. Urbanowski[‡], J. Campbell[§], A. Dunn[¶], M. Fain^{||}, R. Gunsalus^{**}, P. Lostroh[‡], C. Lupp^{*}, J. McCann^{*}, D. Millikan^{*}, A. Schaefer^{*}, E. Stabb[¶], A. Stevens^{||}, K. Visick^{††}, C. Whistler^{*}, and E. P. Greenberg[‡]

PNAS (2005)

The *Wolbachia* Genome of *Brugia malayi*: Endosymbiont Evolution within a Human Pathogenic Nematode

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PLoS Biology
(2005)

Genome sequence of *Bacillus cereus* and comparative analysis with *Bacillus anthracis*

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Nature (2003)

Future directions

- **Metagenomics: analysis of mixed microbial communities**
- **Affordable, rapid sequencing and analysis (typing) of entire strain collections**
- **Integration of other data types *e.g.* phenotype microarrays**
- **Molecular diagnostics: expression chips and probe design**

Acknowledgements

***Xylella / Fusobacterium* comparative genomics**

Bill and Helene Feil (UC Berkeley)
Joint Genome Institute (DoE)
Vinayak Kapatral (Integrated Genomics)

Renibacterium salmoninarum

Mark Strom (NOAA)
Greg Wiens (USDA)
Henry Burd (Integrated Genomics)

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